

DIAGNOSTIC ALGORITHM BENCHMARKING

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Objectives

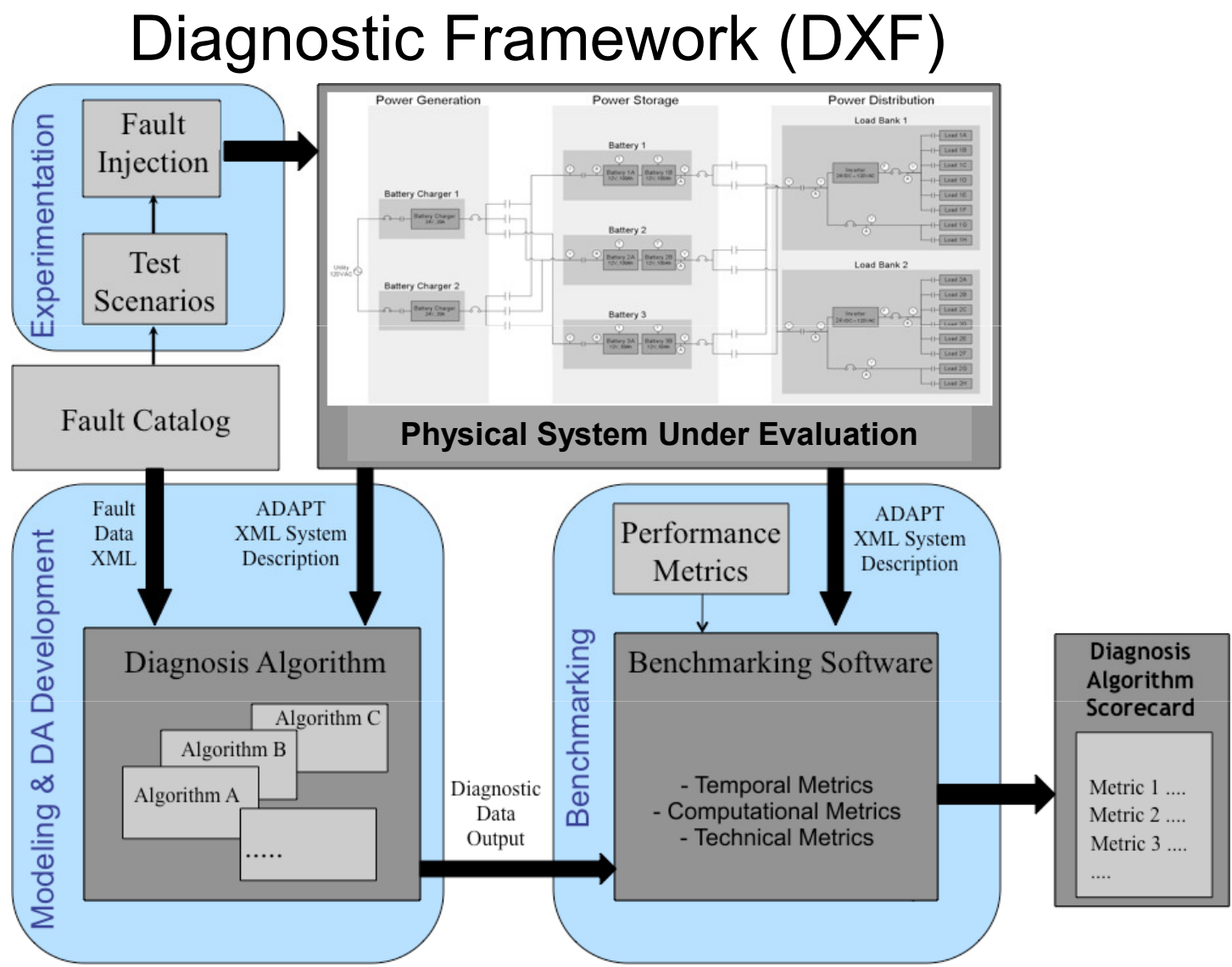
- Benchmark diagnostic algorithms (DAs) using standardized platform
- Compare performance empirically
- Facilitate research in and maturation of diagnostic technologies

Challenges

- Various diagnostic approaches (expert systems, model-based, data-driven, stochastic)
- Diagnostic algorithms support different operational contexts – difficult to define evaluation criteria

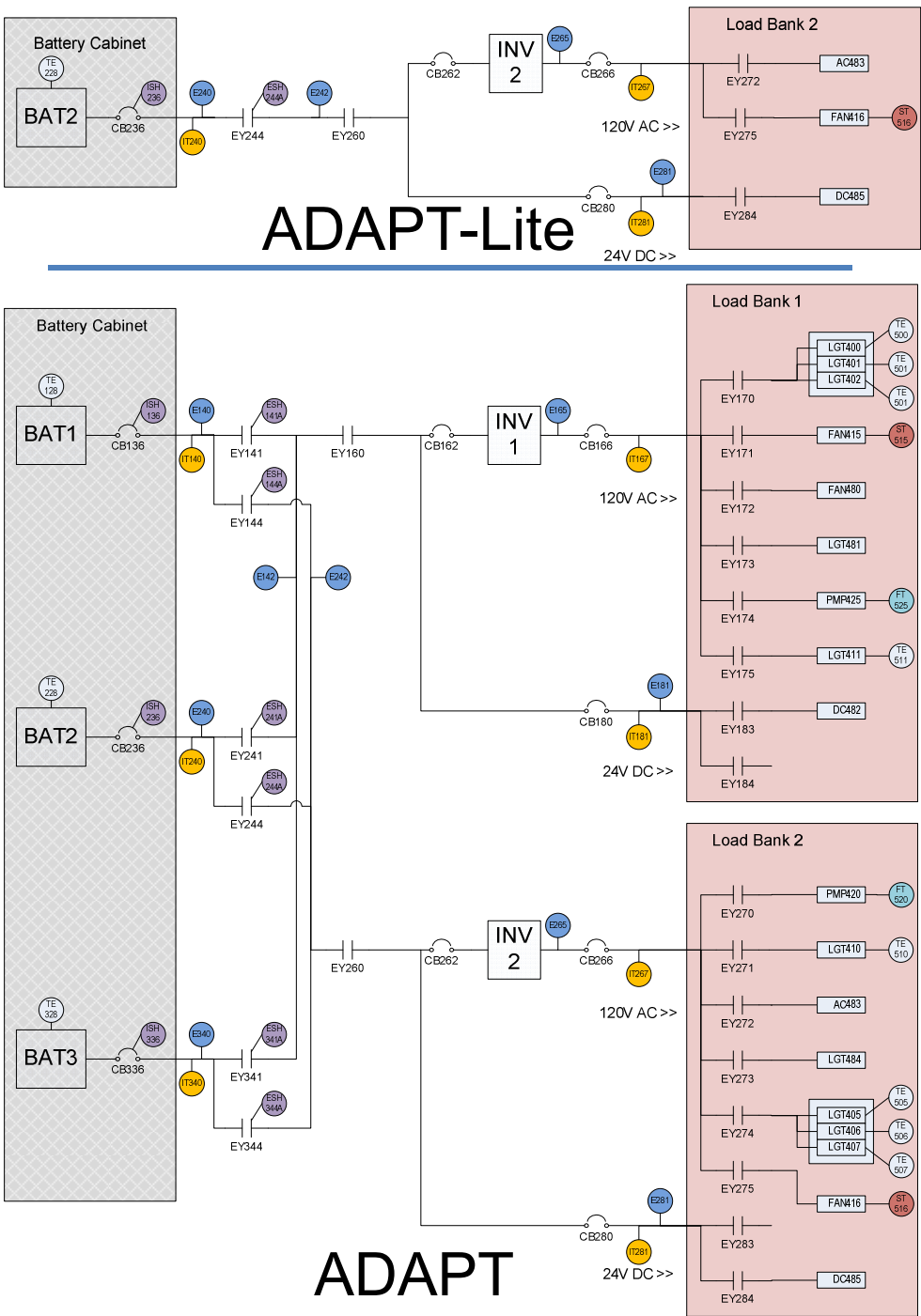
Approach

- Acquire nominal and faulty experimental data with known ground truth
- Use standard formats for system description, data, and diagnosis results
- Create software framework to execute diagnostic algorithms and evaluate performance



- High-level representation of physical system description, sensor data, diagnosis output
- Run-time architecture for executing DAs with experimental scenarios
- Evaluation component that evaluates DAs using pre-defined metrics

Implementation



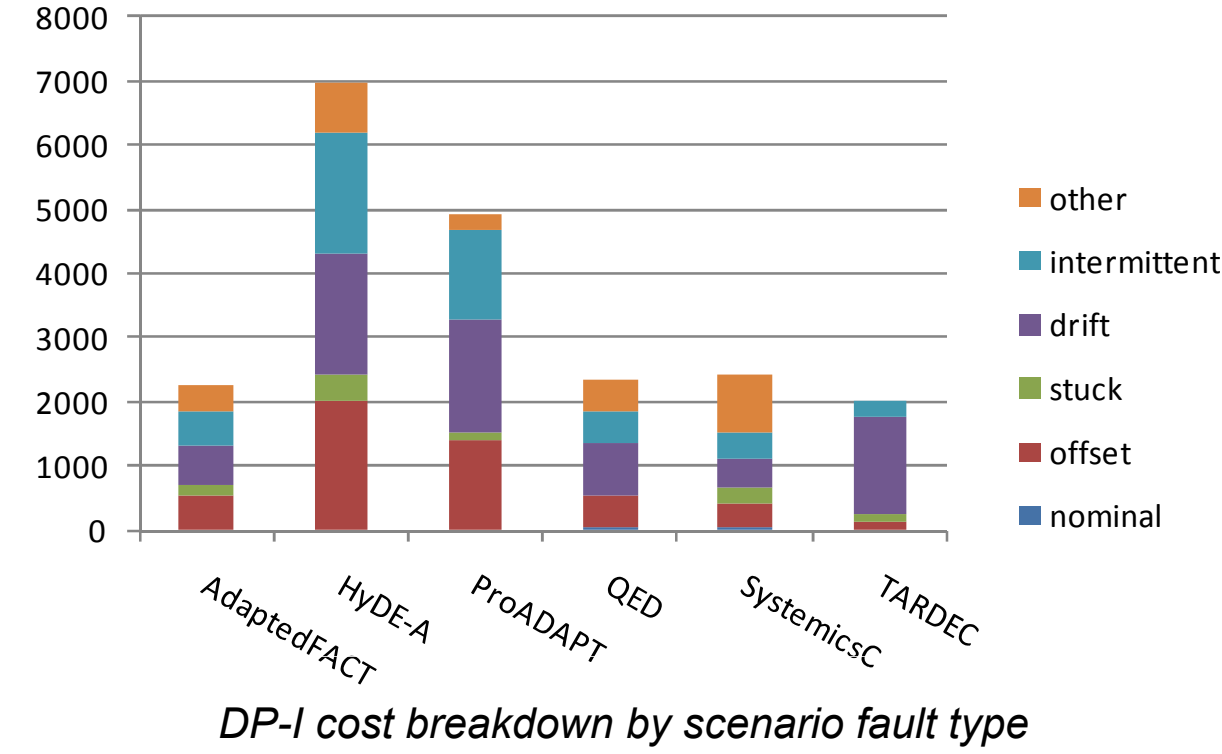
- Two system descriptions created from the ADAPT Electrical Power System testbed
- Archived ~4 minute nominal and faulty scenarios with known ground truth for ADAPT-Lite and ADAPT systems

DXC'10 Diagnostic Problems

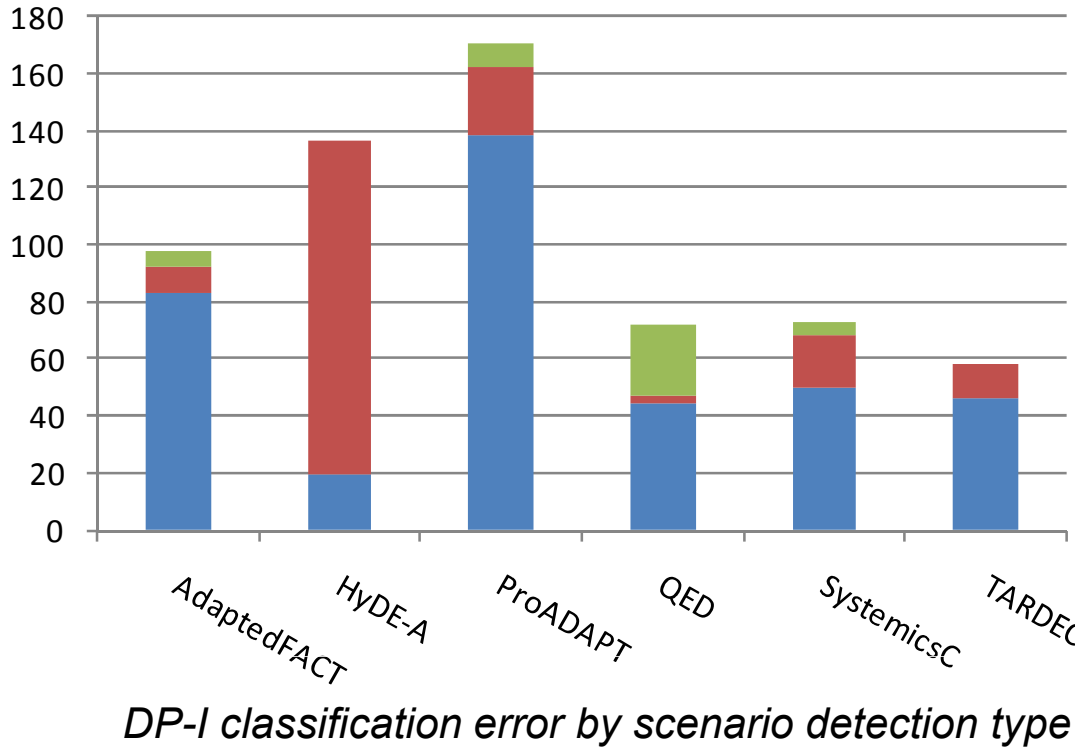
| Aspect | DP-I | DP-II |
|-------------------------------|---------------------------|-------------------------------|
| system | ADAPT-Lite | ADAPT |
| operational scenario | single-string UAS mission | redundant systems UAS mission |
| diagnostic use case | abort rec. | fault recovery rec. |
| #comps | 25 | 96 |
| #modes | 102 | 306 |
| initial relay state | closed | open |
| initial circuit breaker state | closed | closed |
| nominal mode changes | no | yes |
| multiple faults | no | yes |
| fault types | offset | yes |
| | drift | yes |
| | (incipient) | no |
| | intermittent | no |

- DXF and ADAPT EPS scenarios used in two diagnostic competitions (DXC'09, DXC'10), hosted by the International Workshop on Principles of Diagnosis
- DXC'10 introduced new challenges: new fault types, reduced sensor set, multiple sample rates

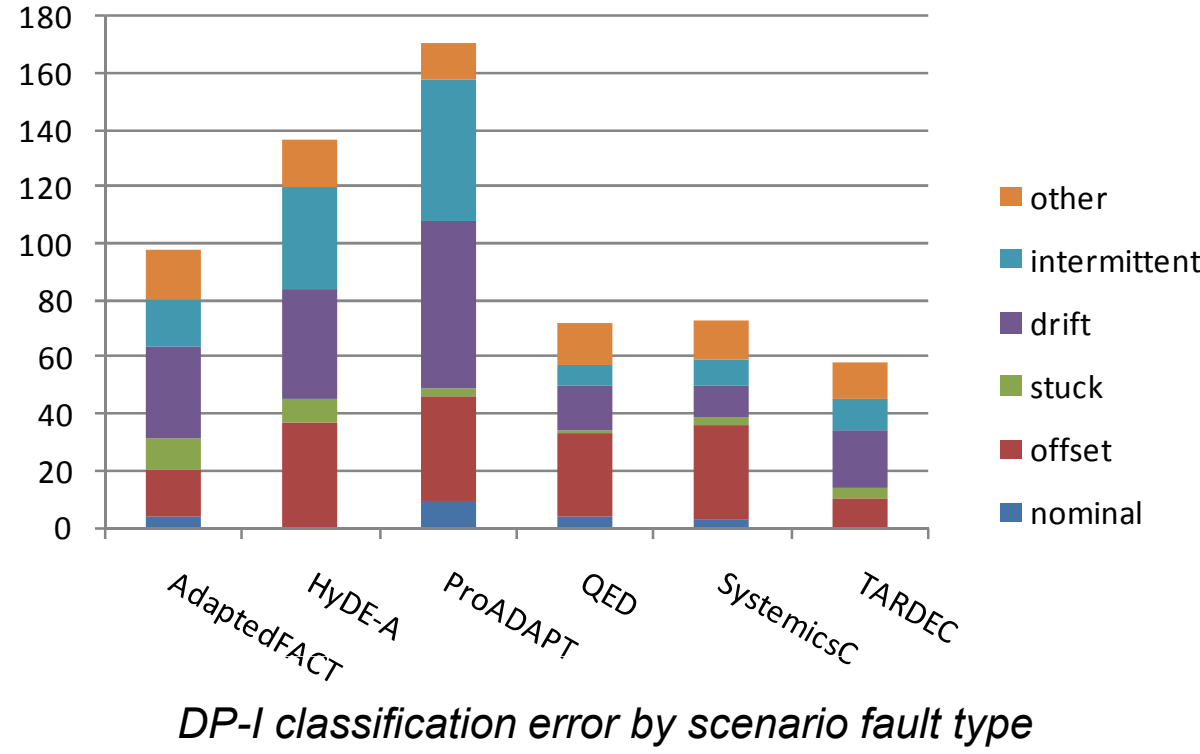
Results (only DXC'10 DP-I shown, see links for more information)



DP-I cost breakdown by scenario fault type



DP-I classification error by scenario detection type



DP-I classification error by scenario fault type

| Actual \ Case DA rec. | abort | non-abort |
|-----------------------|-----------------------------|---------------|
| abort | 0 | $C_{mission}$ |
| non-abort | $C_{mission} + C_{vehicle}$ | 0 |

$C_{mission} = 25, C_{vehicle} = 100$

| DA | Cost | Rank |
|-------------|------|------|
| AdaptedFACT | 2250 | 2 |
| HyDE-A | 6950 | 6 |
| ProADAPT | 4925 | 5 |
| QED | 2350 | 3 |
| SystemicsC | 2400 | 4 |
| TARDEC | 2000 | 1 |

By comparison, DA that always aborts = 2225, DA that never aborts = 8125, Minimum possible cost = 0

| Metric | Name | Category |
|-----------|-----------------------------|-------------|
| M_{fd} | fault detection time | detection |
| M_{fn} | false negative rate | detection |
| M_{fp} | false positive rate | detection |
| M_{da} | scenario detection accuracy | detection |
| M_{fi} | fault isolation time | isolation |
| M_{err} | classification errors | isolation |
| M_{cpu} | CPU load | computation |
| M_{mem} | memory load | computation |

- No DA dominates all metrics
- Real-world system noise, latencies, transients, and coding errors resulted in DA false positives and classification errors

Publications and Data Sets

ADAPT Electrical Power System information, software framework, sample data, test data, results, publications and presentations are available on DASHlink:

- DXC'09: <https://c3.ndc.nasa.gov/dashlink/projects/36/>
- DXC'10: <https://c3.ndc.nasa.gov/dashlink/projects/33/>

| DA | M_{fd} (s) | M_{fn} | M_{fp} | M_{da} | M_{fi} (s) | M_{err} | M_{cpu} (ms) | M_{mem} (kb) |
|-------------|--------------|----------|----------|----------|--------------|-----------|----------------|----------------|
| AdaptedFACT | 21.462 | 0.069 | 0.040 | 0.901 | 151.746 | 98.000 | 37189 | 9656 |
| HyDE-A | 27.717 | 0.873 | 0.000 | 0.240 | 29.355 | 136.030 | 1550 | 6463 |
| ProADAPT | 15.990 | 0.179 | 0.019 | 0.825 | 64.711 | 171.000 | 6356 | 4373 |
| QED | 7.307 | 0.015 | 0.105 | 0.882 | 115.499 | 71.752 | 239 | 5364 |
| SystemicsC | 9.390 | 0.134 | 0.026 | 0.856 | 13.860 | 73.000 | 229057 | 3151 |
| TARDEC | 162.638 | 0.090 | 0.000 | 0.922 | 162.638 | 58.000 | 8979 | 3211 |

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